Prediction of 2024 US election ...*

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We forecast the winner of the 2024 US presidential election using "poll-of-polls" by building a linear model.

cleaned_data = read_csv(here("data/02-analysis_data/cleaned_data.csv"))

```
Rows: 1732 Columns: 13
-- Column specification -------
Delimiter: ","
chr (4): pollster, methodology, state, candidate_name
dbl (7): poll_id, pollster_id, question_id, sample_size, pollscore, days_ta...
date (2): end_date, start_date

i Use `spec()` to retrieve the full column specification for this data.
i Specify the column types or set `show_col_types = FALSE` to quiet this message.
```

1 Introduction

Election result forecasting has become an essential tool for analysts in political science and the public to predict the outcome of democratic process, such as the presidential election in the United States. Traditionally, individual polls have been used as a snapshot of voter sentiment, but they only reflect temporary changes in the performance of contestants, instead of a precise estimation of the election result. As discussed by Pasek (2015) and Blumenthal (2014), the aggregation of multiple polls, or "poll-of-polls," has become a popular technique to reduce individual survey errors and provide more accurate election forecasts. However, the traditional poll aggregation does not reflect dynamics of an election, especially with real-time changes and the introduction of new data. This creates a gap for a more adaptable model

^{*}Code and data are available at: https://github.com/yulexun/uselection.

to predict the election result based on both polling data and additional variables, such as historical data and economic indicators.

This paper fills the gap by building a hybrid election forecasting model following the strategies mentioned by Pasek (2015). As Pasek (2015) described in their article, aggregation involves determining which surveys are worth including, as well as selecting, combining and averaging results from multiple polls to reduce individual biases and errors. Prediction modeling adds other data to the model that predicts election outcomes based on current dynamics. Hybrid models like the Bayesian approach incorporates prior beliefs based on historical data or expert knowledge and new evidence like economic updates to dynamically adjust the forecast as the campaign progresses.

In this paper, we aim to predict the 2024 us election result with the hybrid election forcasting model. We incorporate aggregation by filtering the polls on FiveThirtyEight (2024) by numeric grade that indicates pollster's reliability, prediction that incorporates social and economic indicators including unemployment rates and abortion rates, and hybrid approaches that leverages Bayesian techniques which combines historical data such as the 2016 election data, allowing for a dynamic prediction of the U.S. presidential election.

The estimand for this research paper is the predicted support percentages for Kamala Harris and Donald Trump. The prediction is based on quantifying various polling factors, including sample size, poll scores, and transparency scores, which are used as predictors.

The results of this model indicate a more stable and accurate forecast compared to traditional aggregation methods alone, [update this ...]

The remainder of this paper is structured as follows: [update this ...]

2 Data

2.1 Overview

For the data we used in this analysis about the polling result for Kamala Harris and Donalad Trump in 2024 USA president election.

- response variable: pct(pct: The percentage of the vote or support that the candidate received in the poll)
- numeric predictor:

sample size(sample_size: The total number of respondents participating in the poll)
timegap(the time gap between the poll start date and the real election date i.e timegap =
real US election date - poll start date)

pollscore(A numeric value representing the score or reliability of the pollster in question)

- categorical predictor state (The U.S. state where the poll was conducted or focused) methodology (The method used to conduct the poll)

pct vs methodolo pct vs sample siz pct vs pollscore 청 ⁴⁰ tod 40 20 20 0 -0 2000 4000 6000 8000 -0.8 -0.4 ive/Rhidin sample size pollscore wind speed pct vs days taken pct vs state 60 tod 40 40 pct 20 20 0 20 40 60 80 100 max gust speed total snow

Table 1

2.2 Explore the data

pct vs sample size:

• pct vs sample size:

This scatter plot shows the pct against the sample size, with a fitted trend line indicating a slight positive relationship. The data points are denser for lower sample sizes, suggesting that smaller sample sizes are more common in the dataset.

• pct vs pollscore:

This scatter plot illustrates the pct against pollscore. The fitted trend line suggests a weak negative relationship between pollscore and pct. The points are scattered without a strong linear pattern.

• pct vs methodology:

A boxplot comparing pct for different polling methodologies. The pct distribution varies across methodologies, with some showing greater spread or median differences. This suggests that the polling methodology may influence pct outcomes.

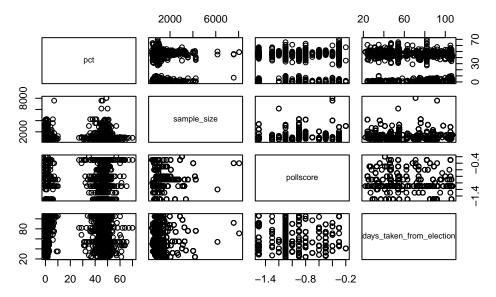
• pct vs days taken from election:

A scatter plot displaying pct versus the number of days before the election. The trend line indicates a slight negative relationship, suggesting that as the election date approaches, pct may decrease slightly.

• pct vs state:

A boxplot depicting pct across different states. The pct distribution varies by state, with some states showing wider variability or different median values, implying state-specific effects on pct.

```
# numeric_data <- cleaned_data[sapply(cleaned_data, is.numeric)]
numeric_data = cleaned_data |> select(pct, sample_size, pollscore, days_taken_from_election)
# Create the pairs plot
pairs(numeric_data)
```



The pairs plot displays scatter plots of four numeric variables (pct, sample_size, pollscore, and days_taken_from_election) to visualize their relationships. The data shows clustering, particularly in pct versus sample_size, suggesting potential heteroscedasticity. The sample_size variable is skewed towards lower values, while pollscore and days_taken_from_election have a more even spread, though pollscore shows central clustering. No strong linear relationships are immediately apparent between the variables, indicating that correlations are likely weak. Further statistical analysis would be beneficial to better understand these relationships and confirm any potential patterns.

2.3 Measurement

In this dataset, each row represents a polling question that records the variables of interest. Each entry allows us to explore the real-world relationships between polling factors and the support percentage (pct) for the candidates Kamala Harris and Donald Trump. This dataset enables an analysis of how various polling characteristics influence the reported support levels for the candidates we are focused.

2.4 Clean Data

The data cleaning process involves several steps to ensure the quality and relevance of the polling data. First, we filter the dataset to retain only poll results with a numeric grade of 2.7 or higher, indicating that the polls are considered reliable. Next, we address missing values in the state attribute: polls with NA in the state column are considered national polls.

We then create a new attribute, days_taken_from_election, which represents the time gap between the poll's start date and the actual U.S. election date. Additionally, we filter the dataset to include only polls conducted after July 21, 2024, the date when Kamala Harris declared her candidacy. Finally, we remove any remaining rows that contain missing values to ensure a clean dataset.

sample_size pollscore days_taken_from_electistate methodology candidate_name

4180 -0.8 24 National Online Ad Kamala
Harris

24

24

24

24

National

National

National

National

Online Ad

Online Ad

Online Ad

Online Ad

National Online Ad

Donald Trump

Jill Stein

Kamala Harris

Chase Oliver

Cornel West

Table 2: Sample of cleaned US election data

2.5 Basic Statistics Summary for Data

4180

4180

4180

4180

4180

3 Model

pct

47.6

50.7

0.8

0.1

0.1

48.1

The goal of our modelling strategy is twofold. Firstly,...

-0.8

-0.8

-0.8

-0.8

-0.8

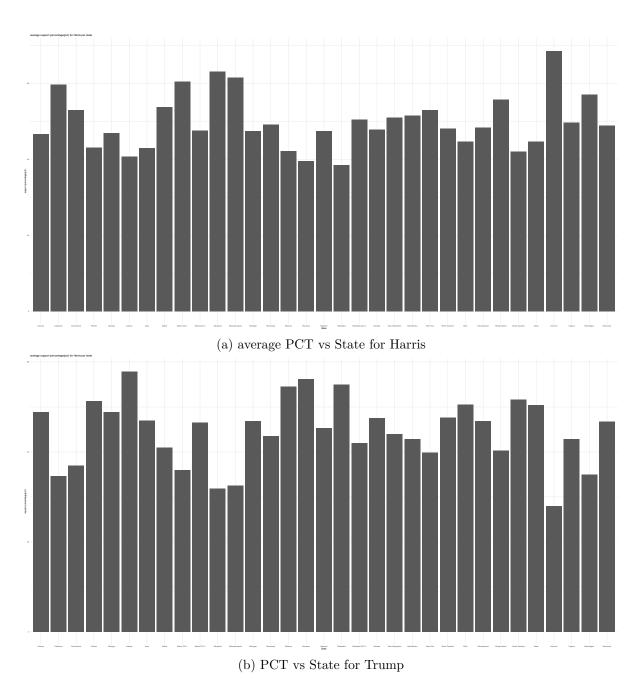


Figure 1: the average PCT vs State for Harris and Trump

Here we briefly describe the Bayesian analysis model used to investigate... Background details and diagnostics are included in Appendix B.

3.1 Model set-up

Define y_i as the number of seconds that the plane remained aloft. Then β_i is the wing width and γ_i is the wing length, both measured in millimeters.

$$y_i | \mu_i, \sigma \sim \text{Normal}(\mu_i, \sigma)$$
 (1)

$$\mu_i = \alpha + \beta_i + \gamma_i \tag{2}$$

$$\alpha \sim \text{Normal}(0, 2.5)$$
 (3)

$$\beta \sim \text{Normal}(0, 2.5)$$
 (4)

$$\gamma \sim \text{Normal}(0, 2.5)$$
 (5)

$$\sigma \sim \text{Exponential}(1)$$
 (6)

We run the model in R (R Core Team 2023) using the rstanarm package of (rstanarm?). We use the default priors from rstanarm. us

3.2 Basic Model

```
just_harris_data = Harris_data |> na.omit()
lm_model1 = lm(pct ~ pollscore, data = just_harris_data)
predictions = predict(lm_model1, just_harris_data)
summary(lm_model1)
```

Call:

```
lm(formula = pct ~ pollscore, data = just_harris_data)
```

Residuals:

```
Min 1Q Median 3Q Max -11.645 -2.069 0.203 1.899 18.508
```

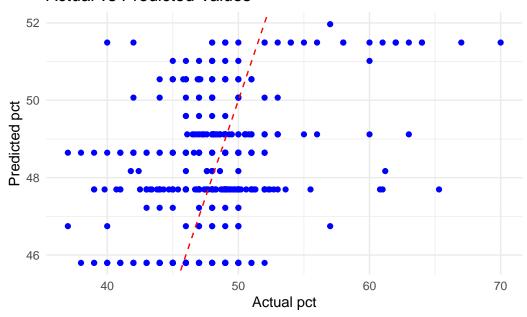
Coefficients:

```
Estimate Std. Error t value Pr(>|t|)
(Intercept) 52.9164 0.5428 97.486 <2e-16 ***
pollscore 4.7463 0.5127 9.257 <2e-16 ***
```

```
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

Residual standard error: 3.903 on 516 degrees of freedom Multiple R-squared: 0.1424, Adjusted R-squared: 0.1408 F-statistic: 85.69 on 1 and 516 DF, p-value: < 2.2e-16

Actual vs Predicted Values



```
just_harris_data = Harris_data |> na.omit()
model_MLR = lm(pct ~ pollscore + days_taken_from_election + methodology + sample_size + state
summary(model_MLR)
```

Call:

```
lm(formula = pct ~ pollscore + days_taken_from_election + methodology +
    sample_size + state, data = just_harris_data)
```

Residuals:

Min 1Q Median 3Q Max -9.0969 -1.1595 0.0562 1.5570 7.0946

Coefficients:

Coefficients:	
	Estimate
(Intercept)	44.1277725
pollscore	0.6957470
days_taken_from_election	-0.0286633
methodologyIVR	4.3755995
methodologyIVR/Online Panel	4.5408555
methodologyIVR/Online Panel/Text-to-Web	5.6053696
methodologyIVR/Text-to-Web	2.8861250
methodologyLive Phone	
methodologyLive Phone/Email	5.0393270
methodologyLive Phone/Online Panel	
methodologyLive Phone/Online Panel/Text	6.0152341
methodologyLive Phone/Online Panel/Text-to-Web	6.1643495
methodologyLive Phone/Probability Panel	4.8917595
methodologyLive Phone/Text-to-Web	5.3247727
methodologyLive Phone/Text-to-Web/Email/Mail-to-Web/Mail-to-Phone	5.1159380
methodologyOnline Ad	4.4724863
methodologyOnline Panel	4.3020832
methodologyOnline Panel/Text-to-Web	5.4176519
methodologyProbability Panel	4.3784976
sample_size	0.0001966
stateCalifornia	13.5880559
stateConnecticut	5.4946250
stateFlorida	-3.6166529
stateGeorgia	0.3471056
stateIndiana	-6.7288415
stateIowa	-2.6335576
stateMaine	7.3774201
stateMaine CD-1	14.2434871
stateMaine CD-2	1.2510054
stateMaryland	15.1021065
stateMassachusetts	14.4818410
stateMichigan	1.1601060
stateMinnesota	3.4353532
stateMissouri	-4.1448797
stateMontana	-6.6623737
stateNational	1.0112185

stateNebraska	0 7007065	
stateNebraska CD-2	-8.7907865 4.1641888	
stateNevada	1.4087338 4.4437365	
stateNew Hampshire		
stateNew Mexico	4.8666391	
stateNew York	6.4186360	
stateNorth Carolina	1.4900945	
stateOhio	-2.4899589	
statePennsylvania	1.7969108	
stateRhode Island	8.3684246 -1.6078727	
stateSouth Carolina		
stateTexas	-2.1479128	
stateVermont	22.3712259	
stateVirginia	3.6823360	
stateWashington	10.1103450	
stateWisconsin	2.5434848	
	Std. Error	
(Intercept)	2.9822092	
pollscore	0.4343844	
days_taken_from_election	0.0046950	
methodologyIVR	3.8898588	
methodologyIVR/Online Panel	3.3520078	
methodologyIVR/Online Panel/Text-to-Web		
methodologyIVR/Text-to-Web		
methodologyLive Phone		
methodologyLive Phone/Email		
methodologyLive Phone/Online Panel		
methodologyLive Phone/Online Panel/Text		
methodologyLive Phone/Online Panel/Text-to-Web	2.9572494	
methodologyLive Phone/Probability Panel	3.7585229	
methodologyLive Phone/Text-to-Web	2.9423181	
methodologyLive Phone/Text-to-Web/Email/Mail-to-Web/Mail-to-Phone	3.4002360	
methodologyOnline Ad	2.9411956	
methodologyOnline Panel	2.9374017	
methodologyOnline Panel/Text-to-Web	2.9194457	
methodologyProbability Panel	2.9113364	
sample_size	0.0001615	
stateCalifornia	1.7481502	
stateConnecticut	2.4005692	
stateFlorida	0.8538744	
stateGeorgia	0.5745183	
stateIndiana	2.4430457	
stateIowa	2.3860179	

stateMaine	1.3448331 1.3505224	
stateMaine CD-1		
stateMaine CD-2	1.3511221	
stateMaryland	1.1865952	
stateMassachusetts	1.2623777	
stateMichigan	0.5900257	
stateMinnesota	1.0583496	
stateMissouri	1.7395350	
stateMontana	1.0602866	
stateNational	0.5010647	
stateNebraska	1.7420707	
stateNebraska CD-2	1.0871315	
stateNevada	0.7520971	
stateNew Hampshire	1.0173114	
stateNew Mexico	1.4344565	
stateNew York	1.1451673	
stateNorth Carolina	0.5531490	
stateOhio	0.8912255	
statePennsylvania	0.5241319	
stateRhode Island	1.4420034	
stateSouth Carolina	3.0728726	
stateTexas	0.8318991	
stateVermont	1.7728897	
stateVirginia	1.0672606	
stateWashington	2.4059846	
stateWisconsin	0.5706889	
	t value	
(Intercept)	14.797	
pollscore	1.602	
days_taken_from_election	-6.105	
methodologyIVR	1.125	
methodologyIVR/Online Panel	1.355	
methodologyIVR/Online Panel/Text-to-Web	1.897	
methodologyIVR/Text-to-Web	0.894	
methodologyLive Phone	1.319	
methodologyLive Phone/Email	1.641	
methodologyLive Phone/Online Panel	0.219	
methodologyLive Phone/Online Panel/Text	1.604	
methodologyLive Phone/Online Panel/Text-to-Web	2.084	
methodologyLive Phone/Probability Panel	1.302	
methodologyLive Phone/Text-to-Web	1.810	
methodologyLive Phone/Text-to-Web/Email/Mail-to-Web/Mail-to-Phone	1.505	
methodologyOnline Ad	1.521	

methodologyOnline Panel	1.465
methodologyOnline Panel/Text-to-Web	1.856
methodologyProbability Panel	1.504
sample_size	1.217
stateCalifornia	7.773
stateConnecticut	2.289
stateFlorida	-4.236
stateGeorgia	0.604
stateIndiana	-2.754
stateIowa	-1.104
stateMaine	5.486
stateMaine CD-1	10.547
stateMaine CD-2	0.926
stateMaryland	12.727
stateMassachusetts	11.472
stateMichigan	1.966
stateMinnesota	3.246
stateMissouri	-2.383
stateMontana	-6.284
stateNational	2.018
stateNebraska	-5.046
stateNebraska CD-2	3.830
stateNevada	1.873
stateNew Hampshire	4.368
stateNew Mexico	3.393
stateNew York	5.605
stateNorth Carolina	2.694
stateOhio	-2.794
statePennsylvania	3.428
stateRhode Island	5.803
stateSouth Carolina	-0.523
stateTexas	-2.582
stateVermont	12.619
stateVirginia	3.450
stateWashington	4.202
stateWisconsin	4.457
	Pr(> t)
(Intercept)	< 2e-16 ***
pollscore	0.109903
days_taken_from_election	2.17e-09 ***
methodologyIVR	0.261222
methodologyIVR/Online Panel	0.176180
methodologyIVR/Online Panel/Text-to-Web	0.058473 .

methodologyIVR/Text-to-Web	0.372012	
methodologyLive Phone	0.187906	
methodologyLive Phone/Email	0.101535	
methodologyLive Phone/Online Panel	0.826382	
methodologyLive Phone/Online Panel/Text	0.109472	
methodologyLive Phone/Online Panel/Text-to-Web	0.037660	*
methodologyLive Phone/Probability Panel	0.193727	
methodologyLive Phone/Text-to-Web	0.070983	•
methodologyLive Phone/Text-to-Web/Email/Mail-to-Web/Mail-to-Phone	0.133109	
methodologyOnline Ad	0.129030	
methodologyOnline Panel	0.143708	
methodologyOnline Panel/Text-to-Web	0.064126	•
methodologyProbability Panel	0.133272	
sample_size	0.224107	
stateCalifornia	4.95e-14	***
stateConnecticut	0.022533	*
stateFlorida	2.75e-05	***
stateGeorgia	0.546026	
stateIndiana	0.006112	**
stateIowa	0.270273	
stateMaine	6.77e-08	***
stateMaine CD-1	< 2e-16	***
stateMaine CD-2	0.354977	
stateMaryland	< 2e-16	
stateMassachusetts	< 2e-16	
stateMichigan	0.049869	
stateMinnesota	0.001255	
stateMissouri	0.017584	
stateMontana	7.60e-10	
stateNational	0.044149	
stateNebraska	6.47e-07	
stateNebraska CD-2	0.000145	
stateNevada	0.061684	-
stateNew Hampshire	1.55e-05	
stateNew Mexico	0.000751	
stateNew York stateNorth Carolina	3.57e-08	
stateNorth Carolina stateOhio	0.007318 0.005423	
stateUnio statePennsylvania	0.005423	
stateRhode Island	1.20e-08	
stateSouth Carolina	0.601051	-111-
stateTexas	0.001031	*
stateVermont	< 2e-16	
Doctoration	· 26 10	

```
0.000611 ***
stateVirginia
                                                               3.17e-05 ***
stateWashington
stateWisconsin
                                                               1.04e-05 ***
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
Residual standard error: 2.346 on 466 degrees of freedom
Multiple R-squared: 0.7203, Adjusted R-squared: 0.6897
F-statistic: 23.53 on 51 and 466 DF, p-value: < 2.2e-16
predictions = predict(model_MLR, just_harris_data)
ggplot(just_harris_data, aes(x = end_date)) +
 geom_point(aes(y = pct), color = "black") +
 geom_line(aes(y = fitted_value), color = "blue", linetype = "dotted") +
 facet_wrap(vars(methodology)) +
 theme classic() +
 labs(y = "Harris percent", x = "Date", title = "Linear Model: pct ~ end_date + pollster")
`geom_line()`: Each group consists of only one observation.
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`geom_line()`: Each group consists of only one observation.
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`geom_line()`: Each group consists of only one observation.
i Do you need to adjust the group aesthetic?
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conversion failure on '8' in 'mbcsToSbcs': dot substituted for <e6>
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Warning in grid.Call.graphics(C_text, as.graphicsAnnot(x\$label), x\$x, x\$y, : conversion failure on '8' in 'mbcsToSbcs': dot substituted for <9c>

Warning in grid.Call.graphics(C_text, as.graphicsAnnot(x\$label), x\$x, x\$y, : conversion failure on '8' in 'mbcsToSbcs': dot substituted for <88>

Warning in grid.Call.graphics(C_text, as.graphicsAnnot(x\$label), x\$x, x\$y, : conversion failure on '9' in 'mbcsToSbcs': dot substituted for <e6>

Warning in grid.Call.graphics(C_text, as.graphicsAnnot(x\$label), x\$x, x\$y, : conversion failure on '9' in 'mbcsToSbcs': dot substituted for <9c>

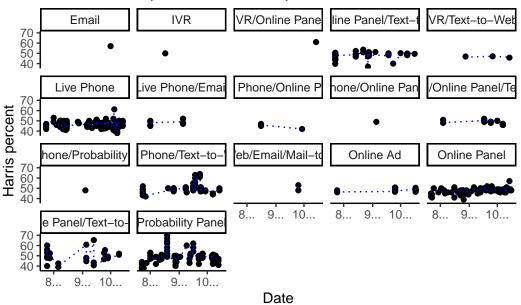
Warning in grid.Call.graphics(C_text, as.graphicsAnnot(x\$label), x\$x, x\$y, :
conversion failure on '9' in 'mbcsToSbcs': dot substituted for <88>

Warning in grid.Call.graphics(C_text, as.graphicsAnnot(x\$label), x\$x, x\$y, : conversion failure on '10' in 'mbcsToSbcs': dot substituted for <e6>

Warning in grid.Call.graphics(C_text, as.graphicsAnnot(x\$label), x\$x, x\$y, : conversion failure on '10' in 'mbcsToSbcs': dot substituted for <9c>

Warning in grid.Call.graphics(C_text, as.graphicsAnnot(x\$label), x\$x, x\$y, : conversion failure on '10' in 'mbcsToSbcs': dot substituted for <88>

Linear Model: pct ~ end_date + pollster



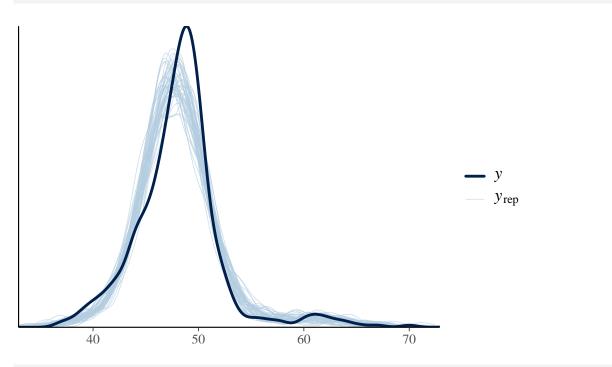
Actual vs Predicted Values 70 40 Actual pct Actual pct

```
baye_model_data = just_harris_data
baye_model_data$pct = as.factor(baye_model_data$pct)
baye_model_data$pollscore = as.factor(baye_model_data$pollscore)
baye_model_data$days_taken_from_election = as.factor(baye_model_data$days_taken_from_election)
baye_model_data$methodology = as.factor(baye_model_data$methodology)
baye_model_data$pct <- as.numeric(baye_model_data$pct)</pre>
# Define the Bayesian model with brms
formula <- pct ~ pollscore + days_taken_from_election + (1 | methodology) + (1 | state)</pre>
priors = normal(0, 2.5, autoscale = TRUE)
bayesian_model_1 <- stan_glmer(</pre>
  formula = formula,
  data = just_harris_data,
  family = gaussian(),
  prior = priors,
  prior_intercept = priors,
  seed = 123,
  cores = 4,
  adapt_delta = 0.95
```

Warning: Bulk Effective Samples Size (ESS) is too low, indicating posterior means and median

Running the chains for more iterations may help. See https://mc-stan.org/misc/warnings.html#bulk-ess

pp_check(bayesian_model_1)



summary(bayesian_model_1)

Model Info:

function: stan_glmer

family: gaussian [identity]

formula: pct ~ pollscore + days_taken_from_election + (1 | methodology) +

(1 | state)

algorithm: sampling

sample: 4000 (posterior sample size)
priors: see help('prior_summary')

observations: 518

groups: state (33), methodology (17)

Estimates:

mean (Intercept) 51.7 pollscore 0.8

days_taken_from	n election	0.0
b[(Intercept) s		-2.5
-	state:California]	9.6
_	state:Connecticut]	2.6
b[(Intercept) s		-6.1
b[(Intercept) s		-2.2
b[(Intercept) s		-8.1
b[(Intercept) s		-4.7
b[(Intercept) s		4.6
_	state:Maine_CD-1]	11.2
_	tate:Maine_CD-2]	-1.5
b[(Intercept) s		12.2
_	state:Massachusetts]	11.4
b[(Intercept) s		-1.4
b[(Intercept) s	· · · · · · · · · · · · · · · · · · ·	0.8
b[(Intercept) s	state:Missouri]	-6.3
b[(Intercept) s		-9.0
b[(Intercept) s	state:National]	-1.5
b[(Intercept) s	state:Nebraska]	-10.4
b[(Intercept) s	state:Nebraska_CD-2]	1.5
b[(Intercept) s	state:Nevada]	-1.2
b[(Intercept) s	state:New_Hampshire]	1.9
b[(Intercept) s	state:New_Mexico]	2.3
b[(Intercept) s	state:New_York]	3.7
b[(Intercept) s	state:North_Carolina]	-1.2
b[(Intercept) s	state:Ohio]	-4.9
b[(Intercept) s	state:Pennsylvania]	-0.7
<pre>b[(Intercept) s</pre>	tate:Rhode_Island]	5.4
<pre>b[(Intercept) s</pre>	state:South_Carolina]	-6.6
b[(Intercept) s	tate:Texas]	-4.6
b[(Intercept) s	state:Vermont]	18.4
b[(Intercept) s	state:Virginia]	0.3
b[(Intercept) s	state:Washington]	6.6
<pre>b[(Intercept) s</pre>	state:Wisconsin]	0.0
b[(Intercept) m	nethodology:Email]	-0.3
b[(Intercept) m	5	0.0
_	nethodology:IVR/Online_Panel]	0.1
_	nethodology:IVR/Online_Panel/Text-to-Web]	0.7
_	nethodology:IVR/Text-to-Web]	-0.5
-	nethodology:Live_Phone]	-0.8
-	nethodology:Live_Phone/Email]	0.1
=	nethodology:Live_Phone/Online_Panel]	-0.7
b[(Intercept) m	nethodology:Live_Phone/Online_Panel/Text]	0.2

```
b[(Intercept) methodology:Live_Phone/Online_Panel/Text-to-Web]
                                                                                       1.0
b[(Intercept) methodology:Live_Phone/Probability_Panel]
                                                                                      0.0
b[(Intercept) methodology:Live_Phone/Text-to-Web]
                                                                                      0.6
b[(Intercept) methodology:Live_Phone/Text-to-Web/Email/Mail-to-Web/Mail-to-Phone]
                                                                                      0.1
b[(Intercept) methodology:Online Ad]
                                                                                     -0.1
b[(Intercept) methodology:Online Panel]
                                                                                     -0.3
b[(Intercept) methodology:Online Panel/Text-to-Web]
                                                                                      0.6
b[(Intercept) methodology:Probability_Panel]
                                                                                     -0.2
                                                                                      2.4
sigma
Sigma[state:(Intercept),(Intercept)]
                                                                                     46.5
Sigma[methodology:(Intercept),(Intercept)]
                                                                                      0.7
                                                                                       sd
(Intercept)
                                                                                       1.3
pollscore
                                                                                      0.4
days_taken_from_election
                                                                                      0.0
b[(Intercept) state:Arizona]
                                                                                       1.3
b[(Intercept) state:California]
                                                                                       1.7
b[(Intercept) state:Connecticut]
                                                                                      2.5
b[(Intercept) state:Florida]
                                                                                       1.4
b[(Intercept) state:Georgia]
                                                                                       1.3
b[(Intercept) state:Indiana]
                                                                                      2.5
b[(Intercept) state:Iowa]
                                                                                      2.4
b[(Intercept) state:Maine]
                                                                                      1.7
b[(Intercept) state:Maine_CD-1]
                                                                                       1.7
b[(Intercept) state:Maine_CD-2]
                                                                                      1.6
b[(Intercept) state:Maryland]
                                                                                       1.6
b[(Intercept) state:Massachusetts]
                                                                                       1.7
b[(Intercept) state:Michigan]
                                                                                       1.3
b[(Intercept) state:Minnesota]
                                                                                       1.5
b[(Intercept) state:Missouri]
                                                                                      2.0
b[(Intercept) state:Montana]
                                                                                       1.5
b[(Intercept) state:National]
                                                                                       1.2
b[(Intercept) state:Nebraska]
                                                                                      2.0
b[(Intercept) state:Nebraska_CD-2]
                                                                                       1.5
b[(Intercept) state:Nevada]
                                                                                      1.4
b[(Intercept) state:New Hampshire]
                                                                                       1.5
b[(Intercept) state:New Mexico]
                                                                                      1.8
b[(Intercept) state:New_York]
                                                                                       1.6
b[(Intercept) state:North_Carolina]
                                                                                      1.3
b[(Intercept) state:Ohio]
                                                                                       1.4
b[(Intercept) state:Pennsylvania]
                                                                                       1.2
b[(Intercept) state:Rhode_Island]
                                                                                       1.8
b[(Intercept) state:South_Carolina]
                                                                                       2.6
```

```
b[(Intercept) state:Texas]
                                                                                      1.4
b[(Intercept) state:Vermont]
                                                                                      2.1
b[(Intercept) state:Virginia]
                                                                                      1.5
b[(Intercept) state:Washington]
                                                                                      2.5
b[(Intercept) state:Wisconsin]
                                                                                      1.3
b[(Intercept) methodology:Email]
                                                                                      0.8
b[(Intercept) methodology:IVR]
                                                                                      0.8
b[(Intercept) methodology:IVR/Online Panel]
                                                                                      0.8
b[(Intercept) methodology:IVR/Online Panel/Text-to-Web]
                                                                                      0.4
b[(Intercept) methodology:IVR/Text-to-Web]
                                                                                      0.7
b[(Intercept) methodology:Live_Phone]
                                                                                      0.3
b[(Intercept) methodology:Live_Phone/Email]
                                                                                      0.6
b[(Intercept) methodology:Live_Phone/Online_Panel]
                                                                                      0.8
b[(Intercept) methodology:Live_Phone/Online_Panel/Text]
                                                                                      0.8
b[(Intercept) methodology:Live_Phone/Online_Panel/Text-to-Web]
                                                                                      0.5
b[(Intercept) methodology:Live_Phone/Probability_Panel]
                                                                                      0.8
b[(Intercept) methodology:Live_Phone/Text-to-Web]
                                                                                      0.4
b[(Intercept) methodology:Live Phone/Text-to-Web/Email/Mail-to-Web/Mail-to-Phone]
                                                                                      0.7
b[(Intercept) methodology:Online_Ad]
                                                                                      0.5
b[(Intercept) methodology:Online Panel]
                                                                                      0.4
b[(Intercept) methodology:Online Panel/Text-to-Web]
                                                                                      0.5
b[(Intercept) methodology:Probability Panel]
                                                                                      0.4
                                                                                      0.1
Sigma[state:(Intercept),(Intercept)]
                                                                                     12.1
Sigma[methodology:(Intercept),(Intercept)]
                                                                                      0.6
                                                                                      10%
                                                                                     50.0
(Intercept)
pollscore
                                                                                      0.3
days_taken_from_election
                                                                                      0.0
b[(Intercept) state:Arizona]
                                                                                     -4.1
b[(Intercept) state:California]
                                                                                      7.5
b[(Intercept) state:Connecticut]
                                                                                     -0.6
b[(Intercept) state:Florida]
                                                                                     -7.9
                                                                                     -3.8
b[(Intercept) state:Georgia]
b[(Intercept) state:Indiana]
                                                                                    -11.3
                                                                                     -7.7
b[(Intercept) state:Iowa]
b[(Intercept) state:Maine]
                                                                                      2.5
b[(Intercept) state:Maine_CD-1]
                                                                                      9.0
b[(Intercept) state:Maine_CD-2]
                                                                                     -3.5
b[(Intercept) state:Maryland]
                                                                                     10.1
b[(Intercept) state:Massachusetts]
                                                                                      9.3
b[(Intercept) state:Michigan]
                                                                                     -3.0
b[(Intercept) state:Minnesota]
                                                                                     -1.2
```

```
b[(Intercept) state:Missouri]
                                                                                     -8.8
b[(Intercept) state:Montana]
                                                                                    -11.0
b[(Intercept) state:National]
                                                                                     -3.0
b[(Intercept) state:Nebraska]
                                                                                    -13.0
b[(Intercept) state:Nebraska CD-2]
                                                                                     -0.4
b[(Intercept) state:Nevada]
                                                                                     -2.9
b[(Intercept) state:New Hampshire]
                                                                                      0.1
b[(Intercept) state:New_Mexico]
                                                                                      0.1
b[(Intercept) state:New York]
                                                                                      1.7
b[(Intercept) state:North_Carolina]
                                                                                     -2.7
b[(Intercept) state:Ohio]
                                                                                     -6.7
b[(Intercept) state:Pennsylvania]
                                                                                     -2.3
b[(Intercept) state:Rhode_Island]
                                                                                      3.3
b[(Intercept) state:South_Carolina]
                                                                                     -9.9
b[(Intercept) state:Texas]
                                                                                     -6.4
b[(Intercept) state:Vermont]
                                                                                     15.7
b[(Intercept) state:Virginia]
                                                                                     -1.6
b[(Intercept) state:Washington]
                                                                                      3.4
b[(Intercept) state:Wisconsin]
                                                                                     -1.6
b[(Intercept) methodology:Email]
                                                                                     -1.4
b[(Intercept) methodology:IVR]
                                                                                     -1.0
b[(Intercept) methodology:IVR/Online Panel]
                                                                                     -0.8
b[(Intercept) methodology:IVR/Online_Panel/Text-to-Web]
                                                                                      0.1
b[(Intercept) methodology:IVR/Text-to-Web]
                                                                                     -1.4
b[(Intercept) methodology:Live_Phone]
                                                                                     -1.2
b[(Intercept) methodology:Live_Phone/Email]
                                                                                     -0.6
b[(Intercept) methodology:Live_Phone/Online_Panel]
                                                                                     -1.8
b[(Intercept) methodology:Live_Phone/Online_Panel/Text]
                                                                                     -0.8
b[(Intercept) methodology:Live_Phone/Online_Panel/Text-to-Web]
                                                                                      0.4
b[(Intercept) methodology:Live_Phone/Probability_Panel]
                                                                                     -1.0
b[(Intercept) methodology:Live_Phone/Text-to-Web]
                                                                                      0.1
b[(Intercept) methodology:Live_Phone/Text-to-Web/Email/Mail-to-Web/Mail-to-Phone]
                                                                                    -0.8
b[(Intercept) methodology:Online_Ad]
                                                                                     -0.7
b[(Intercept) methodology:Online_Panel]
                                                                                     -0.8
b[(Intercept) methodology:Online Panel/Text-to-Web]
                                                                                     -0.1
b[(Intercept) methodology:Probability_Panel]
                                                                                     -0.6
                                                                                      2.3
Sigma[state:(Intercept),(Intercept)]
                                                                                     32.9
Sigma[methodology:(Intercept),(Intercept)]
                                                                                      0.2
                                                                                      50%
(Intercept)
                                                                                     51.7
pollscore
                                                                                      0.8
days_taken_from_election
                                                                                      0.0
```

```
b[(Intercept) state:Arizona]
                                                                                     -2.5
b[(Intercept) state:California]
                                                                                      9.6
b[(Intercept) state:Connecticut]
                                                                                      2.6
b[(Intercept) state:Florida]
                                                                                     -6.1
b[(Intercept) state:Georgia]
                                                                                     -2.3
b[(Intercept) state:Indiana]
                                                                                     -8.1
b[(Intercept) state:Iowa]
                                                                                     -4.7
b[(Intercept) state:Maine]
                                                                                      4.5
b[(Intercept) state:Maine CD-1]
                                                                                     11.1
b[(Intercept) state:Maine_CD-2]
                                                                                     -1.5
b[(Intercept) state:Maryland]
                                                                                     12.2
b[(Intercept) state:Massachusetts]
                                                                                     11.4
b[(Intercept) state:Michigan]
                                                                                     -1.4
b[(Intercept) state:Minnesota]
                                                                                      0.8
b[(Intercept) state:Missouri]
                                                                                     -6.3
b[(Intercept) state:Montana]
                                                                                     -9.0
b[(Intercept) state:National]
                                                                                     -1.5
                                                                                    -10.4
b[(Intercept) state:Nebraska]
b[(Intercept) state:Nebraska CD-2]
                                                                                      1.5
                                                                                     -1.2
b[(Intercept) state:Nevada]
b[(Intercept) state:New Hampshire]
                                                                                      1.9
b[(Intercept) state:New Mexico]
                                                                                      2.3
b[(Intercept) state:New York]
                                                                                      3.8
b[(Intercept) state:North_Carolina]
                                                                                     -1.2
b[(Intercept) state:Ohio]
                                                                                     -4.9
b[(Intercept) state:Pennsylvania]
                                                                                     -0.8
b[(Intercept) state:Rhode_Island]
                                                                                      5.4
b[(Intercept) state:South_Carolina]
                                                                                     -6.6
                                                                                     -4.6
b[(Intercept) state:Texas]
b[(Intercept) state:Vermont]
                                                                                     18.3
b[(Intercept) state:Virginia]
                                                                                      0.2
b[(Intercept) state:Washington]
                                                                                      6.5
b[(Intercept) state:Wisconsin]
                                                                                      0.0
b[(Intercept) methodology:Email]
                                                                                     -0.3
b[(Intercept) methodology:IVR]
                                                                                      0.0
                                                                                      0.1
b[(Intercept) methodology:IVR/Online Panel]
b[(Intercept) methodology:IVR/Online Panel/Text-to-Web]
                                                                                      0.7
b[(Intercept) methodology:IVR/Text-to-Web]
                                                                                     -0.4
b[(Intercept) methodology:Live_Phone]
                                                                                     -0.8
b[(Intercept) methodology:Live_Phone/Email]
                                                                                      0.1
b[(Intercept) methodology:Live_Phone/Online_Panel]
                                                                                     -0.6
b[(Intercept) methodology:Live_Phone/Online_Panel/Text]
                                                                                      0.1
b[(Intercept) methodology:Live_Phone/Online_Panel/Text-to-Web]
                                                                                      1.0
```

```
b[(Intercept) methodology:Live_Phone/Probability_Panel]
                                                                                      0.0
b[(Intercept) methodology:Live_Phone/Text-to-Web]
                                                                                      0.6
b[(Intercept) methodology:Live Phone/Text-to-Web/Email/Mail-to-Web/Mail-to-Phone]
                                                                                      0.1
b[(Intercept) methodology:Online_Ad]
                                                                                     -0.1
b[(Intercept) methodology:Online Panel]
                                                                                     -0.3
b[(Intercept) methodology:Online Panel/Text-to-Web]
                                                                                      0.5
b[(Intercept) methodology:Probability Panel]
                                                                                     -0.2
sigma
                                                                                      2.4
Sigma[state:(Intercept),(Intercept)]
                                                                                     44.6
Sigma[methodology:(Intercept),(Intercept)]
                                                                                      0.6
                                                                                      90%
                                                                                     53.3
(Intercept)
                                                                                      1.4
pollscore
days_taken_from_election
                                                                                      0.0
b[(Intercept) state:Arizona]
                                                                                     -1.0
b[(Intercept) state:California]
                                                                                     11.8
b[(Intercept) state:Connecticut]
                                                                                      5.7
                                                                                     -4.2
b[(Intercept) state:Florida]
b[(Intercept) state:Georgia]
                                                                                     -0.7
b[(Intercept) state:Indiana]
                                                                                     -4.9
b[(Intercept) state:Iowa]
                                                                                     -1.6
b[(Intercept) state:Maine]
                                                                                      6.6
b[(Intercept) state:Maine_CD-1]
                                                                                     13.4
b[(Intercept) state:Maine CD-2]
                                                                                      0.6
b[(Intercept) state:Maryland]
                                                                                     14.2
b[(Intercept) state:Massachusetts]
                                                                                     13.5
b[(Intercept) state:Michigan]
                                                                                      0.2
b[(Intercept) state:Minnesota]
                                                                                      2.7
b[(Intercept) state:Missouri]
                                                                                     -3.8
b[(Intercept) state:Montana]
                                                                                     -7.1
b[(Intercept) state:National]
                                                                                      0.0
b[(Intercept) state:Nebraska]
                                                                                     -7.9
b[(Intercept) state:Nebraska_CD-2]
                                                                                      3.4
b[(Intercept) state:Nevada]
                                                                                      0.5
b[(Intercept) state:New Hampshire]
                                                                                      3.8
b[(Intercept) state:New Mexico]
                                                                                      4.6
b[(Intercept) state:New York]
                                                                                      5.7
b[(Intercept) state:North_Carolina]
                                                                                      0.4
b[(Intercept) state:Ohio]
                                                                                     -3.0
b[(Intercept) state:Pennsylvania]
                                                                                      0.8
b[(Intercept) state:Rhode_Island]
                                                                                      7.7
b[(Intercept) state:South_Carolina]
                                                                                     -3.4
b[(Intercept) state:Texas]
                                                                                     -2.8
```

```
b[(Intercept) state:Vermont]
                                                                                     21.1
b[(Intercept) state:Virginia]
                                                                                     2.1
b[(Intercept) state:Washington]
                                                                                     9.9
b[(Intercept) state:Wisconsin]
                                                                                      1.5
b[(Intercept) methodology:Email]
                                                                                     0.6
b[(Intercept) methodology:IVR]
                                                                                     0.9
b[(Intercept) methodology:IVR/Online_Panel]
                                                                                      1.1
b[(Intercept) methodology:IVR/Online_Panel/Text-to-Web]
                                                                                      1.2
b[(Intercept) methodology:IVR/Text-to-Web]
                                                                                     0.4
b[(Intercept) methodology:Live_Phone]
                                                                                     -0.3
b[(Intercept) methodology:Live_Phone/Email]
                                                                                     0.9
b[(Intercept) methodology:Live_Phone/Online_Panel]
                                                                                     0.3
b[(Intercept) methodology:Live_Phone/Online_Panel/Text]
                                                                                      1.1
b[(Intercept) methodology:Live_Phone/Online_Panel/Text-to-Web]
                                                                                      1.7
b[(Intercept) methodology:Live_Phone/Probability_Panel]
                                                                                      1.0
b[(Intercept) methodology:Live_Phone/Text-to-Web]
                                                                                     1.1
b[(Intercept) methodology:Live_Phone/Text-to-Web/Email/Mail-to-Web/Mail-to-Phone]
                                                                                     1.0
b[(Intercept) methodology:Online_Ad]
                                                                                     0.5
b[(Intercept) methodology:Online_Panel]
                                                                                     0.2
b[(Intercept) methodology:Online_Panel/Text-to-Web]
                                                                                      1.2
b[(Intercept) methodology:Probability_Panel]
                                                                                     0.3
                                                                                     2.5
sigma
Sigma[state:(Intercept),(Intercept)]
                                                                                     62.2
Sigma[methodology:(Intercept),(Intercept)]
                                                                                      1.4
```

Fit Diagnostics:

mean sd 10% 50% 90% mean_PPD 48.1 0.1 48.0 48.1 48.3

The mean_ppd is the sample average posterior predictive distribution of the outcome variable

MCMC diagnostics

	mcse
(Intercept)	0.1
pollscore	0.0
days_taken_from_election	0.0
b[(Intercept) state:Arizona]	0.1
b[(Intercept) state:California]	0.1
b[(Intercept) state:Connecticut]	0.1
b[(Intercept) state:Florida]	0.1
b[(Intercept) state:Georgia]	0.1
b[(Intercept) state:Indiana]	0.1
b[(Intercept) state:Iowa]	0.1

```
b[(Intercept) state:Maine]
                                                                                    0.1
b[(Intercept) state:Maine_CD-1]
                                                                                    0.1
b[(Intercept) state:Maine_CD-2]
                                                                                    0.1
b[(Intercept) state:Maryland]
                                                                                    0.1
b[(Intercept) state:Massachusetts]
                                                                                    0.1
b[(Intercept) state:Michigan]
                                                                                    0.1
b[(Intercept) state:Minnesota]
                                                                                    0.1
b[(Intercept) state:Missouri]
                                                                                    0.1
b[(Intercept) state:Montana]
                                                                                    0.1
b[(Intercept) state:National]
                                                                                    0.1
b[(Intercept) state:Nebraska]
                                                                                    0.1
b[(Intercept) state:Nebraska_CD-2]
                                                                                    0.1
b[(Intercept) state:Nevada]
                                                                                    0.1
b[(Intercept) state:New_Hampshire]
                                                                                    0.1
b[(Intercept) state:New_Mexico]
                                                                                    0.1
b[(Intercept) state:New_York]
                                                                                    0.1
b[(Intercept) state:North_Carolina]
                                                                                    0.1
b[(Intercept) state:Ohio]
                                                                                    0.1
b[(Intercept) state:Pennsylvania]
                                                                                    0.1
b[(Intercept) state:Rhode Island]
                                                                                    0.1
b[(Intercept) state:South Carolina]
                                                                                    0.1
b[(Intercept) state:Texas]
                                                                                    0.1
b[(Intercept) state:Vermont]
                                                                                    0.1
b[(Intercept) state:Virginia]
                                                                                    0.1
b[(Intercept) state:Washington]
                                                                                    0.1
b[(Intercept) state:Wisconsin]
                                                                                    0.1
b[(Intercept) methodology:Email]
                                                                                    0.0
b[(Intercept) methodology:IVR]
                                                                                    0.0
b[(Intercept) methodology:IVR/Online_Panel]
                                                                                    0.0
b[(Intercept) methodology:IVR/Online_Panel/Text-to-Web]
                                                                                    0.0
b[(Intercept) methodology:IVR/Text-to-Web]
                                                                                    0.0
b[(Intercept) methodology:Live_Phone]
                                                                                    0.0
b[(Intercept) methodology:Live_Phone/Email]
                                                                                    0.0
b[(Intercept) methodology:Live_Phone/Online_Panel]
                                                                                    0.0
b[(Intercept) methodology:Live Phone/Online Panel/Text]
                                                                                    0.0
b[(Intercept) methodology:Live Phone/Online Panel/Text-to-Web]
                                                                                    0.0
b[(Intercept) methodology:Live Phone/Probability Panel]
                                                                                    0.0
b[(Intercept) methodology:Live Phone/Text-to-Web]
                                                                                    0.0
b[(Intercept) methodology:Live_Phone/Text-to-Web/Email/Mail-to-Web/Mail-to-Phone] 0.0
b[(Intercept) methodology:Online_Ad]
                                                                                    0.0
                                                                                    0.0
b[(Intercept) methodology:Online_Panel]
b[(Intercept) methodology:Online_Panel/Text-to-Web]
                                                                                    0.0
b[(Intercept) methodology:Probability_Panel]
                                                                                    0.0
```

sigma		0.0
Sigma[state:(Intercept),(Intercept)]		0.4
Sigma[methodology:(Intercept),(Intercept)]		0.0
mean_PPD		0.0
log-posterior		0.3
		Rhat
(Intercept)		1.0
pollscore		1.0
days_taken_from	m_election	1.0
b[(Intercept)	state:Arizona]	1.0
b[(Intercept)	state:California]	1.0
b[(Intercept)	state:Connecticut]	1.0
b[(Intercept)	state:Florida]	1.0
b[(Intercept)	state:Georgia]	1.0
b[(Intercept)	state:Indiana]	1.0
b[(Intercept)	state:Iowa]	1.0
b[(Intercept)	state:Maine]	1.0
b[(Intercept)	state:Maine_CD-1]	1.0
b[(Intercept)	state:Maine_CD-2]	1.0
b[(Intercept)	state:Maryland]	1.0
b[(Intercept)	state:Massachusetts]	1.0
b[(Intercept)	state:Michigan]	1.0
b[(Intercept)	state:Minnesota]	1.0
b[(Intercept)	state:Missouri]	1.0
b[(Intercept)	state:Montana]	1.0
b[(Intercept)	state:National]	1.0
b[(Intercept)	state:Nebraska]	1.0
b[(Intercept)	state:Nebraska_CD-2]	1.0
b[(Intercept)	state:Nevada]	1.0
b[(Intercept)	state:New_Hampshire]	1.0
b[(Intercept)	state:New_Mexico]	1.0
b[(Intercept)	state:New_York]	1.0
b[(Intercept)	state:North_Carolina]	1.0
b[(Intercept)	state:Ohio]	1.0
b[(Intercept)	state:Pennsylvania]	1.0
b[(Intercept)	state:Rhode_Island]	1.0
b[(Intercept)	state:South_Carolina]	1.0
b[(Intercept)	state:Texas]	1.0
b[(Intercept)	state:Vermont]	1.0
•	state:Virginia]	1.0
b[(Intercept)	state:Washington]	1.0
b[(Intercept)	state:Wisconsin]	1.0
b[(Intercept)	methodology:Email]	1.0

```
b[(Intercept) methodology:IVR]
                                                                                    1.0
b[(Intercept) methodology:IVR/Online_Panel]
                                                                                    1.0
b[(Intercept) methodology:IVR/Online_Panel/Text-to-Web]
                                                                                    1.0
b[(Intercept) methodology:IVR/Text-to-Web]
                                                                                    1.0
b[(Intercept) methodology:Live Phone]
                                                                                    1.0
b[(Intercept) methodology:Live Phone/Email]
                                                                                    1.0
b[(Intercept) methodology:Live Phone/Online Panel]
                                                                                    1.0
b[(Intercept) methodology:Live Phone/Online Panel/Text]
                                                                                    1.0
b[(Intercept) methodology:Live Phone/Online Panel/Text-to-Web]
                                                                                    1.0
b[(Intercept) methodology:Live_Phone/Probability_Panel]
                                                                                    1.0
b[(Intercept) methodology:Live_Phone/Text-to-Web]
                                                                                    1.0
b[(Intercept) methodology:Live Phone/Text-to-Web/Email/Mail-to-Web/Mail-to-Phone] 1.0
b[(Intercept) methodology:Online_Ad]
                                                                                    1.0
b[(Intercept) methodology:Online_Panel]
                                                                                    1.0
b[(Intercept) methodology:Online_Panel/Text-to-Web]
                                                                                    1.0
b[(Intercept) methodology:Probability_Panel]
                                                                                    1.0
sigma
                                                                                    1.0
Sigma[state:(Intercept),(Intercept)]
                                                                                    1.0
Sigma[methodology:(Intercept),(Intercept)]
                                                                                    1.0
mean PPD
                                                                                    1.0
log-posterior
                                                                                    1.0
                                                                                    n eff
(Intercept)
                                                                                     331
pollscore
                                                                                    5021
days_taken_from_election
                                                                                    6225
b[(Intercept) state:Arizona]
                                                                                     295
b[(Intercept) state:California]
                                                                                     510
b[(Intercept) state:Connecticut]
                                                                                    1460
b[(Intercept) state:Florida]
                                                                                     385
b[(Intercept) state:Georgia]
                                                                                     303
b[(Intercept) state:Indiana]
                                                                                    1363
b[(Intercept) state:Iowa]
                                                                                    1172
b[(Intercept) state:Maine]
                                                                                     485
b[(Intercept) state:Maine_CD-1]
                                                                                     527
b[(Intercept) state:Maine CD-2]
                                                                                     468
b[(Intercept) state:Maryland]
                                                                                     558
b[(Intercept) state:Massachusetts]
                                                                                     461
b[(Intercept) state:Michigan]
                                                                                     307
b[(Intercept) state:Minnesota]
                                                                                     427
b[(Intercept) state:Missouri]
                                                                                     820
b[(Intercept) state:Montana]
                                                                                     414
b[(Intercept) state:National]
                                                                                     278
b[(Intercept) state:Nebraska]
                                                                                     797
```

```
b[(Intercept) state:Nebraska_CD-2]
                                                                                     384
b[(Intercept) state:Nevada]
                                                                                     361
b[(Intercept) state:New_Hampshire]
                                                                                     377
b[(Intercept) state:New_Mexico]
                                                                                     562
b[(Intercept) state:New York]
                                                                                     474
b[(Intercept) state:North_Carolina]
                                                                                     297
b[(Intercept) state:Ohio]
                                                                                     403
b[(Intercept) state:Pennsylvania]
                                                                                     292
b[(Intercept) state:Rhode Island]
                                                                                     616
b[(Intercept) state:South_Carolina]
                                                                                    1523
b[(Intercept) state:Texas]
                                                                                     356
b[(Intercept) state:Vermont]
                                                                                     678
b[(Intercept) state:Virginia]
                                                                                     464
b[(Intercept) state:Washington]
                                                                                    1259
b[(Intercept) state:Wisconsin]
                                                                                     291
b[(Intercept) methodology:Email]
                                                                                    4381
b[(Intercept) methodology:IVR]
                                                                                    6075
b[(Intercept) methodology:IVR/Online_Panel]
                                                                                    5460
b[(Intercept) methodology:IVR/Online_Panel/Text-to-Web]
                                                                                    2763
b[(Intercept) methodology:IVR/Text-to-Web]
                                                                                    4905
b[(Intercept) methodology:Live Phone]
                                                                                    2470
b[(Intercept) methodology:Live Phone/Email]
                                                                                    5022
b[(Intercept) methodology:Live_Phone/Online_Panel]
                                                                                    3153
b[(Intercept) methodology:Live_Phone/Online_Panel/Text]
                                                                                    5470
b[(Intercept) methodology:Live_Phone/Online_Panel/Text-to-Web]
                                                                                    2881
b[(Intercept) methodology:Live_Phone/Probability_Panel]
                                                                                    6178
b[(Intercept) methodology:Live_Phone/Text-to-Web]
                                                                                    2630
b[(Intercept) methodology:Live Phone/Text-to-Web/Email/Mail-to-Web/Mail-to-Phone] 4898
b[(Intercept) methodology:Online_Ad]
                                                                                    3700
b[(Intercept) methodology:Online_Panel]
                                                                                    2577
b[(Intercept) methodology:Online_Panel/Text-to-Web]
                                                                                    3175
b[(Intercept) methodology:Probability_Panel]
                                                                                    2661
sigma
                                                                                    5661
Sigma[state:(Intercept),(Intercept)]
                                                                                     788
Sigma[methodology:(Intercept),(Intercept)]
                                                                                    1671
mean PPD
                                                                                    3885
                                                                                     625
log-posterior
```

For each parameter, mcse is Monte Carlo standard error, n_eff is a crude measure of effective

```
# Plot random effects
plot(bayesian_model_1, pars = "(Intercept)", prob = 0.95)
```

```
Warning: `prob_outer` (0.9) is less than `prob` (0.95) ... Swapping the values of `prob_outer` and `prob`
```

```
(Intercept) - 50 52 54
```

```
# # Transform Biden and Trump's vote shares to fit a beta distribution
# # Biden received 51.3%, Trump received 46.8%, totaling to approximately 98.1% (adjusted here)
# total_votes <- 100</pre>
# biden_shape1 <- 51.3 / total_votes * 10</pre>
# biden_shape2 <- (1 - 51.3 / total_votes) * 10</pre>
# trump_shape1 <- 46.8 / total_votes * 10</pre>
# trump_shape2 <- (1 - 46.8 / total_votes) * 10</pre>
# # Set up priors using beta distributions based on 2020 vote shares
# prior <- c(</pre>
  set_prior(paste0("beta(", biden_shape1, ", ", biden_shape2, ")"), class = "b", coef = "b"
# set_prior(paste0("beta(", trump_shape1, ", ", trump_shape2, ")"), class = "b", coef = "t
# )
# # Define the model formula
# formula <- pct ~ pollscore + days_taken_from_election + methodology
# # Run the Bayesian model
# model <- brm(</pre>
    formula = formula,
```

```
# data = baye_model_data,
# family = categOorical(),
# prior = prior,
# chains = 4,
# iter = 2000,
# warmup = 1000,
# cores =4
# )
# # Summarize the model
# summary(model)
```

3.2.1 Model justification

We expect a positive relationship between the size of the wings and time spent aloft. In particular...

We can use maths by including latex between dollar signs, for instance θ .

4 Results

Our results are summarized in ?@tbl-modelresults.

5 Discussion

5.1 First discussion point

If my paper were 10 pages, then should be at least 2.5 pages. The discussion is a chance to show off what you know and what you learnt from all this.

5.2 Second discussion point

Please don't use these as sub-heading labels - change them to be what your point actually is.

5.3 Third discussion point

5.4 Weaknesses and next steps

Weaknesses and next steps should also be included.

Appendix

A Additional data details

B Model details

B.1 Posterior predictive check

In **?@fig-ppcheckandposteriorvsprior-1** we implement a posterior predictive check. This shows...

In **?@fig-ppcheckandposteriorvsprior-2** we compare the posterior with the prior. This shows...

B.2 Diagnostics

?@fig-stanareyouokay-1 is a trace plot. It shows... This suggests...

?@fig-stanareyouokay-2 is a Rhat plot. It shows... This suggests...

C FiveThirtyEight Licenses

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